

## Article

# Analysis of Dark Current in BRITE\* nanostellite CCD sensors

Adam Popowicz <sup>1\*†</sup> 

<sup>1</sup> Institute of Automatic Control, Silesian University of Technology

\* Correspondence: apopowicz@polsl.pl; Tel.: +48-667-802-518

† Current address: Akademicka 16, 44-100 Gliwice, Poland

**Abstract:** The BRightest Target Explorer (BRITE) is the pioneering nanosatellite mission dedicated for photometric observations of the brightest stars in the sky. The BRITE CCD sensors are poorly shielded against extensive flux of energetic particles which constantly induce defects in the silicon lattice. In this paper we investigate the temporal evolution of the generation of the dark current in the BRITE CCDs over almost 4 years after launch. Utilizing several steps of image processing and employing normalization of the results it was possible to obtain useful information about the progress of thermal activity in the sensors. The outcomes show clear and consistent linear increase of induced damage despite the fact that only about 0.14% of CCD pixels were probed. By performing the analysis of temperature dependencies of the dark current, we identified the observed defects as phosphorus-vacancy (PV) pairs, which are common in proton irradiated CCD matrices. Moreover, the Meyer-Neldel empirical rule was confirmed in our dark current data, yielding  $E_{MN} = 24.8$  meV for proton-induced PV defects.

**Keywords:** CCD defects; space telescopes; nano-satellites

## 1. BRITE-Constellation

The BRight Target Explorer (BRITE) is a constellation of 6 nanosatellites launched in 2013-2014, which are dedicated to high-precise photometry of the brightest stars in blue (b) and red (r) filters. The mission is a collaboration of Canada, Austria and Poland. Each of these countries has two satellites: UniBRITE (UBr) and BRITE Austria (BAb) are Austrian satellites, BRITE Toronto (BTr) and BRITE Montreal (failed to communicate after launch) are Canadian satellites, BRITE Lem (BLb) and BRITE Heweliusz (BHz) are Polish. The satellites are only  $20 \times 20 \times 20$  cm in size and 7 kg in weight, which makes them the smallest satellites performing accurate photometry from space. The spacecraft were designed using the Generic Nanosatellite Bus by the University of Toronto and Space Flight Laboratory. They include 3-axis, reaction wheel stabilization which is performed by the Attitude Determination and Control System (ADCS) utilizing sun sensors, magnetometers and star-tracker. More detailed descriptions of the satellite construction, testing, commissioning and operations can be found in our papers [1,2].

The heart of the satellites is the monochromatic, interline CCD sensor, Kodak KAI-11002M, which is attached to a custom 5-element (4-element in BHz) lens system, which allows observation of a wide,  $24^\circ$  in diameter, field of view. Basic characteristics of employed full-frame image sensors are listed in Table 1. The combination of large-area image sensor and a dedicated lens system allowed for maximizing the number of stars measured simultaneously in a single field. This was also a compromise

\*Based on data collected by the BRITE Constellation satellite mission, designed, built, launched, operated and supported by the Austrian Research Promotion Agency (FFG), the University of Vienna, the Technical University of Graz, the Canadian Space Agency (CSA), the University of Toronto Institute for Aerospace Studies (UTIAS), the Foundation for Polish Science & Technology (FNiTP MNiSW), and National Science Centre (NCN).

32 between the satellite size constraints, the required photometric precision, the pixel and chip size, and  
 33 the number of targets monitored during the mission's expected lifetime.

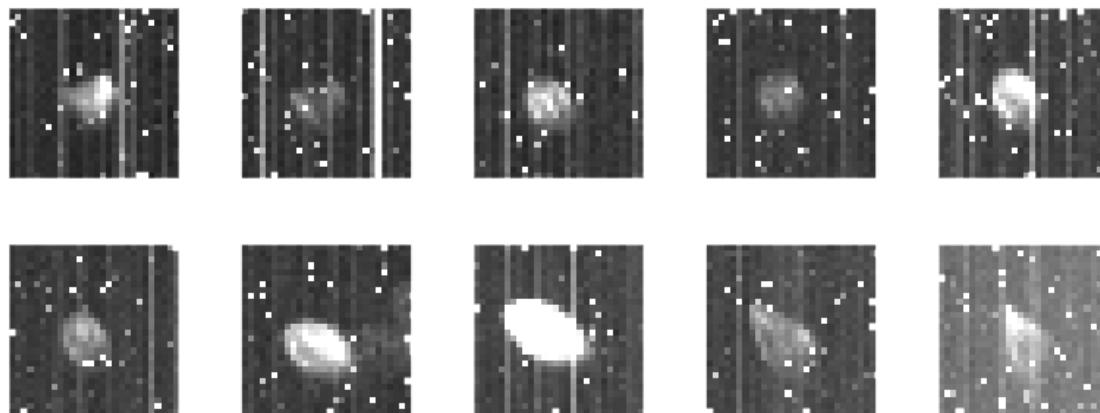
**Table 1.** Characteristics of CCDs installed in BRITE nanosatellites

Parameter	Value
CCD type	interline
Number of pixels	4072 × 2720
Dimensions	37.25 mm × 25.7 mm
Pixel size	9 $\mu$ m × 9 $\mu$ m
Saturation charge	90,000 e <sup>-</sup>
Bit resolution	14 bit

34 In this paper we assess the progress of degradation of CCD matrices installed on-board BRITE  
 35 satellites during almost 4 years of their in-orbit work. Due to the lack of thermal stabilization and  
 36 varying exposure times, such analysis is not a trivial task and it requires applying several steps of  
 37 image processing and proper normalization of the data. Moreover, the analysis can utilize information  
 38 only from a very small portion of the CCD arrays (i.e. only several tiny subrasters per field) and at  
 39 unstabilized temperatures, which are dependent on the observed field.

## 40 2. Imaging with BRITE satellites

41 To make photometric measurements possible, the optical system of the BRITE satellites is  
 42 intentionally defocussed, so that the stellar profiles are spread over several tens of pixels. During  
 43 normal operations only small parts of the image (so-called subrasters), around selected targets,  
 44 are transferred to ground stations, where the photometric measurements are performed by special  
 45 processing procedures [3,4]. Several examples of 28 × 28-pixel subrasters with stellar profiles from  
 46 various parts of the image sensor are presented in Figure 1.

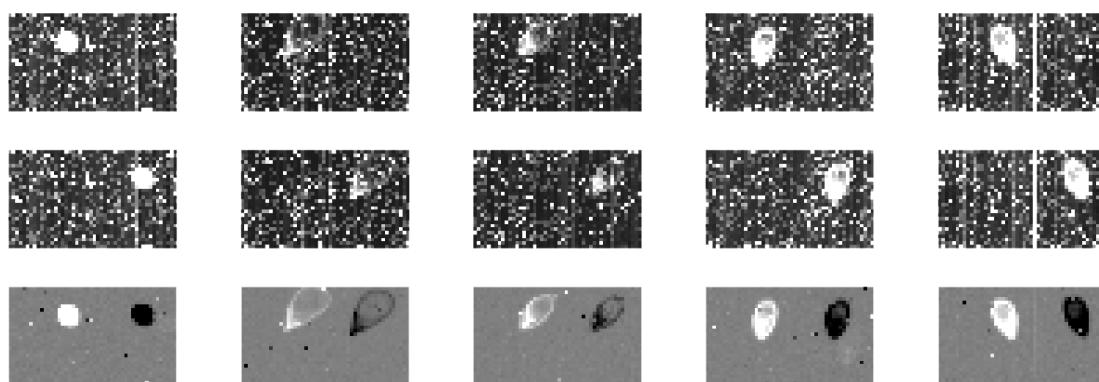


**Figure 1.** Examples of subrasters from an exposure taken by the BAb satellite during observations of a field in Vela-Puppis constellations. Different shapes of profiles are due to the combination of defocusing and aberrations in the optical path.

47 As one can see in Figure 1, the stellar profiles are accompanied by significant noise in the form of  
 48 bright pixels and columns. While the former is the result of dark current generation in silicon defects  
 49 inflicted by energetic particles (protons) impacting the CCD sensor, the latter appears due to the dark  
 50 current generated during the matrix readout in the vertical transferring register (VCCD → see more

51 information about the sensor in the datasheet<sup>1</sup>). Since both types of noise increase with temperature  
 52 and the installed sensors are not thermally stabilized, special techniques of satellite orientation are  
 53 undertaken to reduce unwanted heat. Nevertheless, the temperature of the sensors is usually within  
 54 10–40°C, depending on which field is observed. Three of BRITES (UBr, BAb and BLb) do not house any  
 55 shielding against radiation, while the remaining two are equipped with Borotrone (BHR) and tungsten  
 56 (BTr) shielding, respectively. Importantly, in BTr, due to the lack of space and no chance for re-design,  
 57 only the aluminum CCD header tray was exchanged with one made of tungsten (2mm thick). In BHR,  
 58 which has a different optical design, it was possible to install light-weight hydrogen-rich polyethylene  
 59 (Borotron) shielding (10mm thick).

60 The BRITE constellation was initially operated in so-called stare mode, in which a satellite  
 61 orientation was stabilized so that stellar profiles experienced only slight (usually sub-pixel) shifts.  
 62 Unfortunately, due to the increase in observed noise and the accompanying decrease of photometric  
 63 quality, a so-called chopping mode was introduced and is currently employed by all satellites. In  
 64 this mode, a satellite is moved alternately by several arc minutes (from frame to frame) so that the  
 65 stellar profile is swung between two positions. This allows for operating with difference images (i.e.  
 66 subtraction of two consecutive images), in which the offsets related to the dark current are virtually  
 67 eliminated. Additionally, in the chopping mode the subrasters have to be elongated horizontally  
 68 (24×48 pixels) to allow for safe placement of the stellar profile well within the subraster. This  
 69 is required due to some imperfections of satellite stabilization in both chopping positions. An  
 70 example of the utilization of the chopping mode is presented in Figure 2. A few black or white  
 71 spots visible in difference images (bottom row) are the result of occasional sudden change of dark  
 72 current generation, a phenomenon which is called random telegraph signals (RTS) and was already  
 73 reported in proton-irradiated sensors [5].



**Figure 2.** Examples of the efficient reduction of impulsive noise thanks to the chopping mode. The two upper rows show 5 subrasters from two consecutive measurements. The bottom row shows fully reduced, nearly noiseless differences between the respective upper two images. Data collected by BLb in Cygnus field at 39°C.

### 74 3. Data analysis

#### 75 3.1. CCD image processing

76 As an objective measure of the amount of a sensor's degradation we selected the mean dark  
 77 charge ( $I_d$ ) generated in the photosensitive part of a pixel. However, since the dark charge is collected  
 78 both during the exposure and in the readout phase, the former depends on the exposure time while

1 <http://www.onsemi.com/pub/Collateral/KAI-11002-D.PDF>

79 the latter does not. Therefore, the dark current generated during the readout, visible as offsets in  
 80 columns, has to be compensated to reveal only the thermal generation in photosensitive sites. This  
 81 type of dark current appears due to the thermal generation of electrons within the defects induced in  
 82 the transferring part of a pixel (i.e. in VCCD register). As a result, a slight intensity offset is added to  
 83 all charge pockets transferred through a defective cell during the readout.

84 To this end, initially the median intensity is calculated in each column of a subraster. Then, the  
 85 medians are subtracted from the pixels of each column, so that the column offsets are compensated.  
 86 This way not only is the readout dark current calibrated, but also the charge bias appearing due to the  
 87 scattered light from Moon or Earth shine is effectively removed. After such column compensation, the  
 88 subraster is filtered with a  $3 \times 3$  median filter, so that hot pixels are removed, revealing only the stellar  
 89 profile. Such a median-filtered image is thresholded with 50 ADU and dilated by 2 pixels to find all the  
 90 pixels covered by a stellar profile. Dilation is necessary to include some wings that are dimmer than 50  
 91 ADU but that still belong to the stellar profile. The process of column compensation of raw images is  
 92 then repeated excluding the stellar profile from the calculation of column medians. The procedure  
 93 is iteratively repeated until the detected profile stabilizes. This allows for unbiased estimation and  
 94 reduction of column offsets. An example of the result from the steps of the routine mentioned above is  
 95 shown in Fig. 3.

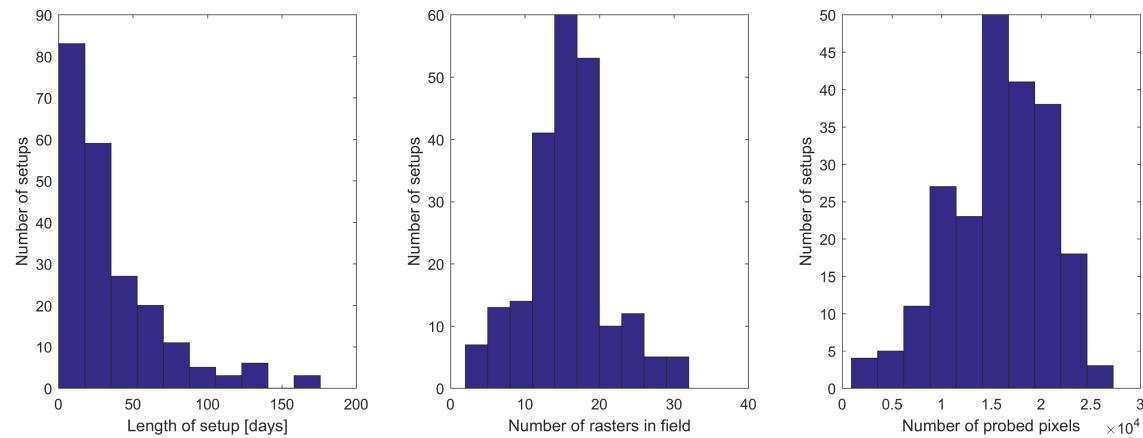


**Figure 3.** An example of the result of the compensation of readout dark current and detection of a stellar profile. From the left: original image, column medians, image after column compensation, outcome of median filtering, detected stellar profile.

96 Now we can calculate the average intensity of a pixel in the compensated image excluding pixels  
 97 detected as a stellar profile. Since the offsets in columns are subtracted, the remaining positive charge  
 98 is related only to the thermal generation of charge (readout noise has zero mean value thus it does not  
 99 disturb the calculations). By dividing the whole collected charge by the number of investigated pixels  
 100 and by the exposure time, we eventually obtain the mean dark current  $I_d$  expressed in electrons per  
 101 second per pixel.

102 In the calculations we use all the subrasters downloaded from the satellite in a given exposure.  
 103 Depending on the observed field and on the satellite, there are 3 to 32 subrasters available. On average  
 104 a total number of 15,800 pixels was probed per exposure, which is only 0.14% of the total number of  
 105 CCD pixels (11 million). Histograms of the number of subrasters and pixels included in the analysis  
 106 are illustrated in the middle and right panel of Fig. 4.

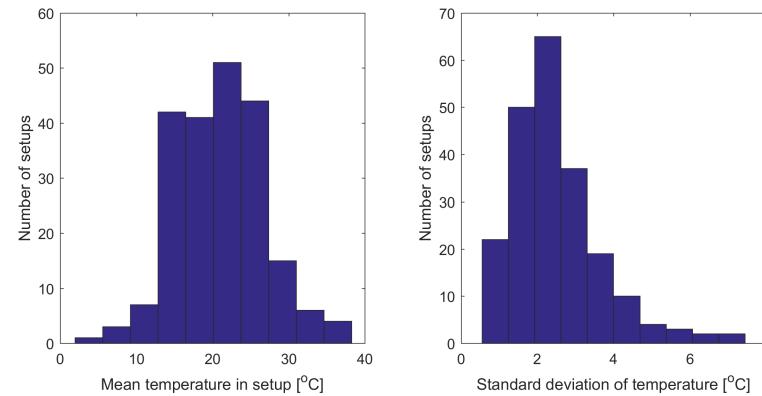
107 Importantly, the data collected by the satellites are divided into so-called setups, which are the  
 108 data sets having the same positions of stars and sizes of subrasters. The setups were introduced to  
 109 maintain consistency in BRITE data. They are changed only in case of problems with satellite stability  
 110 (e.g. lack of proper guide-stars or increase of the scattered light from the Moon or Earth) and when  
 111 switching between observed fields. The spread of time span covered by the setups is presented in  
 112 Fig. 4, on the left. While here we present only the histograms for all satellites together, the detailed  
 113 distribution of the observations from individual BRITE satellites is presented in Appendix A.1. in [3].



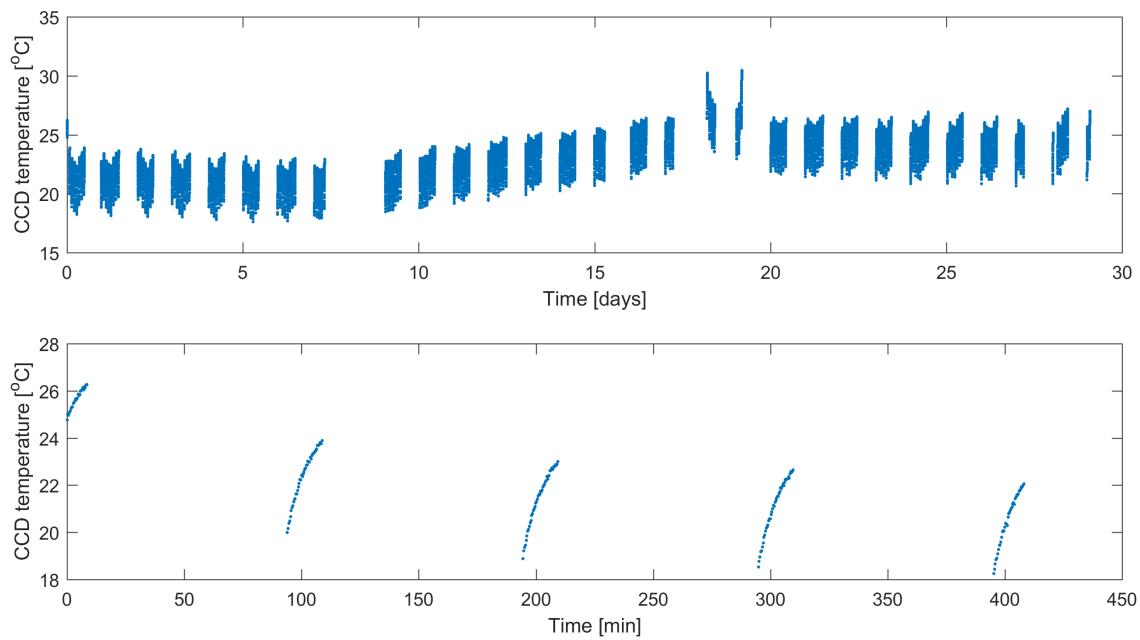
**Figure 4.** Characteristics of data utilized in the dark current analysis. From the left: length of setups in days, number of subrasters per field and number of probed pixels.

### 3.2. Dark current analysis

The temperature of the BRITE CCD sensors is dependent on the orientation of the satellite relatively to the Sun; therefore it may vary significantly between the setups. In the histograms in Fig. 5 the statistics (mean and standard deviation) of temperature across all setups is presented. Moreover, the temperature usually increases within a single orbital period ( $\approx 100$  min) since a satellite gradually comes out of the Earth's shadow and the CCD starts exposures. Exemplary time dependencies of CCD temperature of the BAb satellite in the Orion2016 field are presented in Fig. 6. In this case the temperature drift within a single orbit equals approximately  $4$   $^{\circ}\text{C}$  and a slight long-term trend of  $5$   $^{\circ}\text{C}$  amplitude is also visible. Some transient events appear in many of the setups due to the preceding technical breaks and/or temporal maneuvers which, in the case depicted in Fig. 6, resulted in the increase of heat.



**Figure 5.** Statistics of CCDs temperatures from all 5 nanosatellites, across all setups.



**Figure 6.** Time dependencies of CCD temperature for the BAb satellite, Orion 2016 field. Upper plot - data from whole setup; lower plot - initial 5 orbits.

The temperature variations of the BRITE CCDs are in fact very useful for the dark current analysis, since the temperature dependencies can be approximated and thus the dark current can be scaled to an arbitrary temperature. According to [6,7] the dark current should follow the Arrhenius law:

$$I_d = G \exp(-\Delta E/kT), \quad (1)$$

where  $I_d$  is the amount of dark charge per pixel per time interval,  $G$  is a constant,  $\Delta E$  is the activation energy of thermal electron generation,  $k$  is the Boltzmann constant and  $T$  is the temperature in Kelvins. This relation is usually visualized by plotting the logarithm of dark charge against  $1/kT$  (the so-called Arrhenius plot), which corresponds to the following transformation of (1):

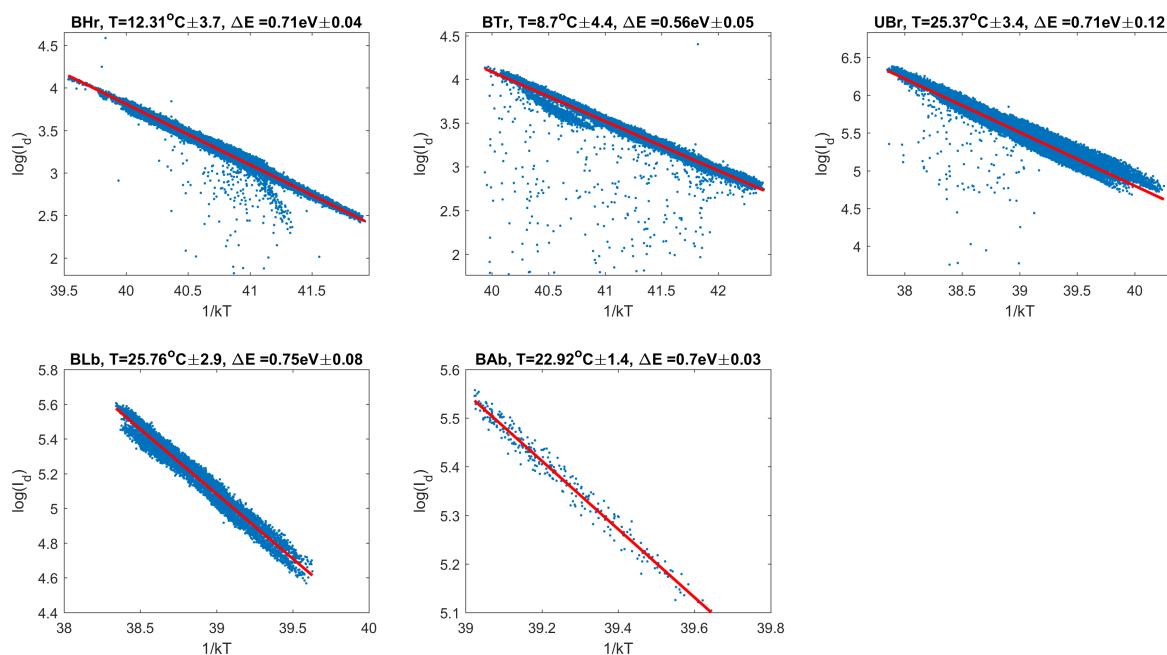
$$\log(I_d) = -\Delta E \frac{1}{kT} + \log(G). \quad (2)$$

125 Fitting a simple linear regression to such a dependency allows one to obtain an estimation of the  
 126 activation energy  $\Delta E$  of the thermal process which can lead to the identification of the type of defects.  
 127 Moreover, it becomes possible to estimate the amount of dark charge at the temperature which is not  
 128 available in a given setup. This enables normalization of the results to the mean dark current rate at an  
 129 arbitrary temperature.

130 The correctness of equation (1) was confirmed in our data. Clearly linear dependencies appeared  
 131 when the logarithm of dark charge was plotted against  $1/kT$ . In Fig. 7 we present the results from  
 132 setup examples collected by BRITE satellites in various temperature conditions and with different  
 133 number of measurements. With these data robust linear fitting (iteratively reweighted least squares  
 134 with a bisquare weighting function, [8]) was performed to estimate the activation energy  $\Delta E$  and the  
 135 factor  $G$ .

**Table 2.** Increase of dark current in BRITE CCDs.

Satellite name	Shielding (material)	Dark current growth		
		[ $e^- s^{-1} \text{pix}^{-1} \text{year}^{-1}$ ] @15°C	@25°C	@35°C
BHr	yes (Borotron, 10 mm)	786	2,846	6,079
BTr	partial (tungsten, 2 mm)	1,202	4,134	9,365
UBr	no	1,372	5,318	12,095
BLb	no	1,363	5,167	12,076
BAb	no	1,851	7,535	17,975

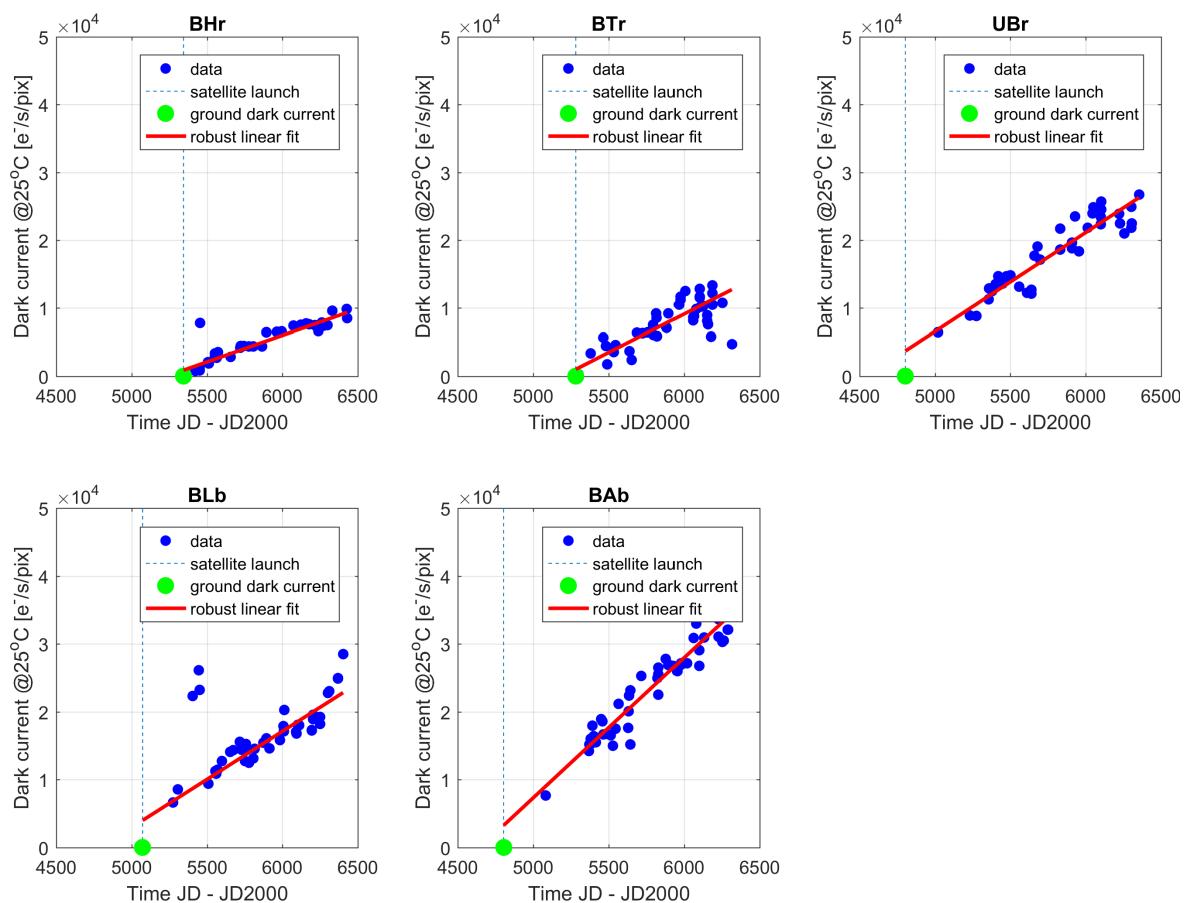


**Figure 7.** Arrhenius plots of the dark current for some setup examples. The following setups (satellites) are: Carina 2017 setup 8 (BHr), Vela Pictor 2016 setup 4 (BTr), Cassiopeia 2016 setup 2 (UBr), Cygnus Lyra 2016 setup 3 (BLb) and Orion 2016 setup 1 (BAb). Red lines indicate a robust linear fit to data points.

#### 136 4. Results and discussion

137 Using the liner relation between temperature and dark current as presented on the Arrhenius  
 138 plots, it is possible to calculate the amount of dark current at 25°C across the mission lifetime and for  
 139 all 5 CCDs. For this particular temperature, the ground based tests indicated that the dark current  
 140 generation rate equals  $21 [e^- s^{-1} \text{pixel}^{-1}]$  (see Table 4 in [1]). The gradual increase of the dark current  
 141 in each of 5 nanosatellites can be observed in Fig. 8. The red line shows a robust linear fit to the data,  
 142 while the blue dashed vertical line indicates the launch date. The derived increase of the dark current  
 143 expressed as a growth of the number electrons per second per pixel at three temperatures (15°C, 25°C  
 144 and 35°C), covering typical thermal conditions of the BRITE CCDs, is listed in Tab. 2.

145 It is apparent that additional shielding installed in the BHr satellite resulted in significant  
 146 limitation of the rate of growth of the defects induced in the CCD. The growth of the dark current  
 147 is nearly twice as smaller when compared with UBr and BLb and almost three times as small when  
 148 compared with BAb. The tungsten CCD tray installed in BTr was not so successful; however, it still  
 149 allowed for absorbing nearly 25% of the damage. It is not clear why the BAb satellite shows 50% larger

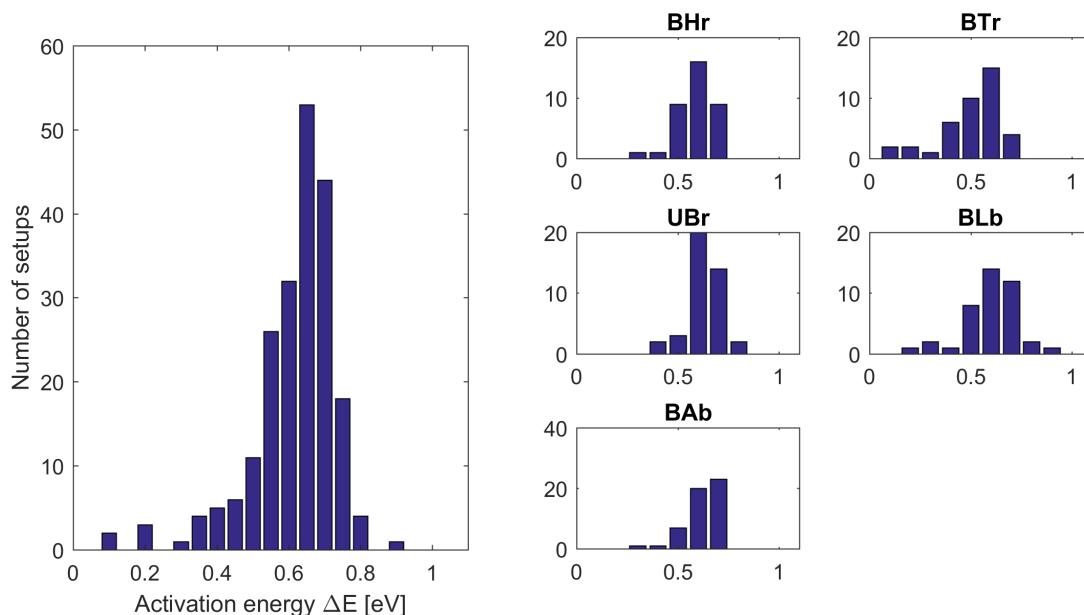


**Figure 8.** Time dependencies of dark current at 25°C in BRITE CCDs for all 5 nanosatellites and almost 4 years of being in orbit. Dashed vertical line indicates the launch date and the green point shows the ground-based dark current. Time is expressed in days elapsed since the epoch 2000.0. Red line is the robust linear fit to the data points (excluding the green point).

150 dark current growth rate when compared to UBr and BLb. All unshielded satellites are operated the  
 151 same way, stay in orbits of similar height, and share the same optical and mechanical design.

152 An interesting observation can be made when comparing the starting point of the dark current  
 153 with that expected from the linear fit. Clearly, unshielded satellites were damaged during the launch,  
 154 so that the dark current generation increased immediately from 21 to approximately  $4000 e^- s^{-1} \text{pix}^{-1}$   
 155 at  $25^\circ\text{C}$ . Such a growth is not present in the shielded satellites, which implies that both shielding  
 156 solutions successfully protected CCDs from energetic particles created while launching a satellite into  
 157 orbit.

158 The temperature dependencies of the dark current permitted the estimation of the activation  
 159 energy of the thermal process in the CCD pixels. The histograms of  $\Delta E$  for all setups collectively  
 160 and for each satellite separately are exposed in Fig. 9 on the left and right side, respectively. The  
 161 median  $\Delta E$  across all CCDs equals 0.68 eV and does not differ between sensors. This is very close to  
 162 the activation energy of a phosphorus-vacancy (PV) dipole, which is 0.70 eV (i.e. 0.44 eV below the  
 163 silicon conduction band - see chapter 8 in [9] or [10]). The induction of PV defects was also reported by  
 164 many authors investigating proton irradiated CCD sensors [11–13].



**Figure 9.** Histograms of the activation energy obtained from the dark current analysis. On the left side: histogram for all satellites; on the right side: individual histograms for each satellite.

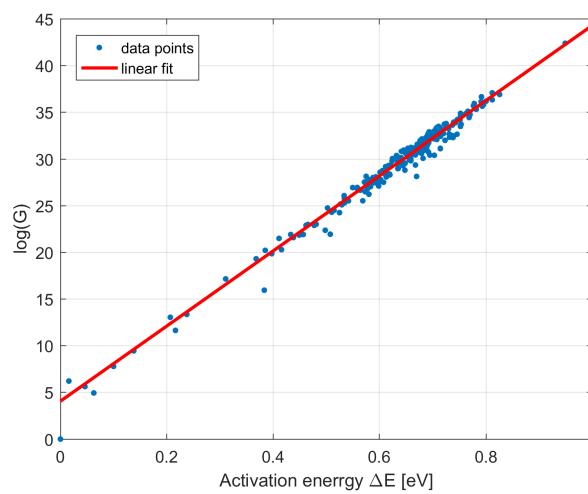
According to the observations made in [7] the factor  $G$  obeys the Meyer-Neldel rule (MNR) [14], which is an experimental rule still not fully understood. This means that  $G$  can be expressed as follows:

$$G = \bar{G} \exp(\Delta E / E_{MN}), \quad (3)$$

165 where  $\bar{G}$  and  $E_{MN}$  are positive MNR constants. While the former can vary between pixels and in time,  
 166 since it is related to the number of defects induced in a pixel, the latter should be constant for a given  
 167 type of defect.

168 The dark current data collected from BRITE CCDs give the unique chance for investigation of the  
 169 correctness of the MNR. Using the dependency between previously obtained  $\log(G)$  and  $\Delta E$ , the MNR  
 170 constant  $E_{MN}$  was estimated at 24.8 meV. The linear fitting made on such logarithmic dependency  
 171 is depicted in Fig. 10. To our best knowledge, this finding is the first such observation made for PV  
 172 defects in CCD sensors irradiated in a space environment. For comparison, the value reported for

<sup>173</sup> ground-based CCDs (not exposed to irradiation), containing defects mainly in the form of impurities  
<sup>174</sup> induced during the sensor's production, was  $E_{MN} = 25.3$  meV [7].



**Figure 10.** The logarithmic relation between factor  $G$  and activation energy  $\Delta E$ . The linear fit to the data leads to the estimation of the MNR constant  $E_{MN} = 25.3$  meV. The data points include the results for the setups collected by all BRITE satellites.

## <sup>175</sup> 5. Summary

<sup>176</sup> Although the pioneering mission of the BRITE nanosatellites allows one to perform photometric  
<sup>177</sup> measurements of stars with very high precision, the CCD sensors installed onboard are exposed to  
<sup>178</sup> strong irradiation and experience gradual degradation. In this paper we present a detailed analysis of  
<sup>179</sup> the progress of the dark current generation in the BRITE CCDs. Several steps of image processing and  
<sup>180</sup> proper data normalization were implemented to retrieve useful information about the evolution of  
<sup>181</sup> thermal activity in pixels.

<sup>182</sup> The results obtained from the analysis of 0.14% of CCD pixels show clearly a linear increase of the  
<sup>183</sup> number of defects induced in CCDs of all 5 nanosatellites. When compared with unshielded satellites,  
<sup>184</sup> the special polyethylene-based shielding installed onboard BRITE Heweliusz (B<sub>H</sub>r) managed to reduce  
<sup>185</sup> the amount of inflicted damage by a factor of two. Moreover, the two satellites equipped with full  
<sup>186</sup> (B<sub>H</sub>r) or partial (B<sub>T</sub>r) shielding made of Borotron or tungsten, respectively, successfully protected  
<sup>187</sup> sensors against the radiation during the launch. Unfortunately, the partial shielding in B<sub>T</sub>r reduced  
<sup>188</sup> the amount of defects created in the orbit only by 25%. It is still an unresolved issue why one of the  
<sup>189</sup> unshielded satellites - B<sub>A</sub>b - shows nearly 50% larger progress in CCD degradation when compared  
<sup>190</sup> with the remaining unshielded devices.

<sup>191</sup> Investigations of temperature dependencies of dark current revealed that the most probable type  
<sup>192</sup> of defects in BRITE sensors is the phosphorus-vacancy (PV) pair. The obtained activation energy of  
<sup>193</sup> the thermal process at 0.44 eV below the silicon conduction band agrees with the previous reports of  
<sup>194</sup> researchers examining proton-irradiated CCDs. Eventually, the empirical Meyer-Neldel rule (MNR)  
<sup>195</sup> for the dark current was confirmed in our data. The MNR constant  $E_{MN}$  was estimated at 24.8 meV  
<sup>196</sup> which is the first such report from CCDs working in space and containing PV defects .

<sup>197</sup> The measured progress of the number of appearing defects may be valuable information for future  
<sup>198</sup> nanosatellite missions which will meet similar size, weight and power constraints. Moreover, the  
<sup>199</sup> results of the presented analysis are essential for assessing the usefulness of relatively small shielding  
<sup>200</sup> made of tungsten or Borotron. The identification of PV defects allows for considering possible ways of  
<sup>201</sup> treating the CCD sensors via annealing.

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<sup>203</sup> Polish National Center of Science (NCN).

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